

# DES Year 3 Results: Cosmology from weak lensing and galaxy clustering

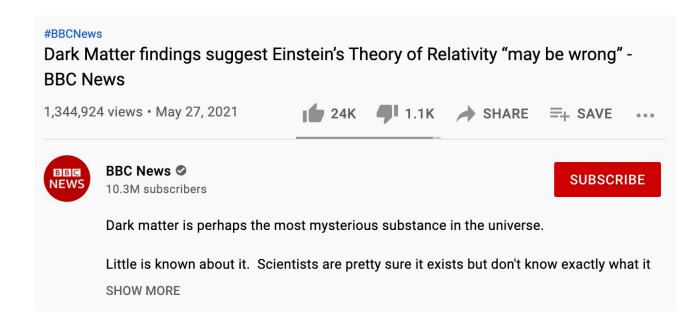
Niall MacCrann (DAMTP, Cambridge),

on behalf of the DES Collaboration



#### What I'll talk about

- A quick large-scale structure cosmology intro
- A quick Dark Energy Survey intro
- A bit about weak gravitational lensing
- The DES Year 3 "3x2pt" analysis and challenges
- Cosmological constraints
- Was Einstein wrong? (not yet, clickbait is real...)





# Large scale structure cosmology

- We have a concordance cosmological model, (flat)  $\Lambda$ CDM.
- Observationally solid, but what is  $\Lambda$ ? (and what is CDM!!?)
- Strong constraints from mature geometrical probes:
  - Standard rulers (BAO in CMB/galaxies)
  - Standard candles (SN1a)
- Largely depend on background quantities e.g. Average energy densities and expansion rate of the Universe.





# Large scale structure cosmology

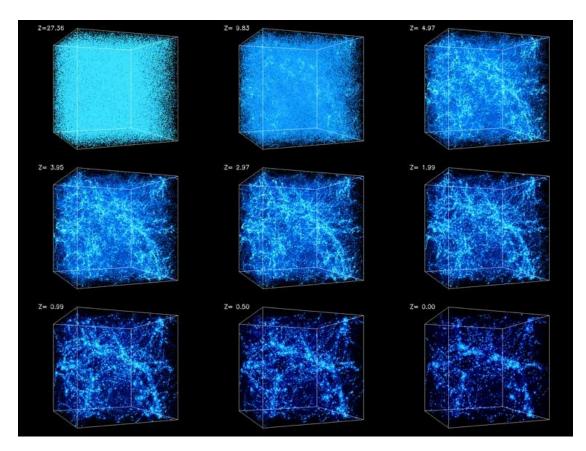
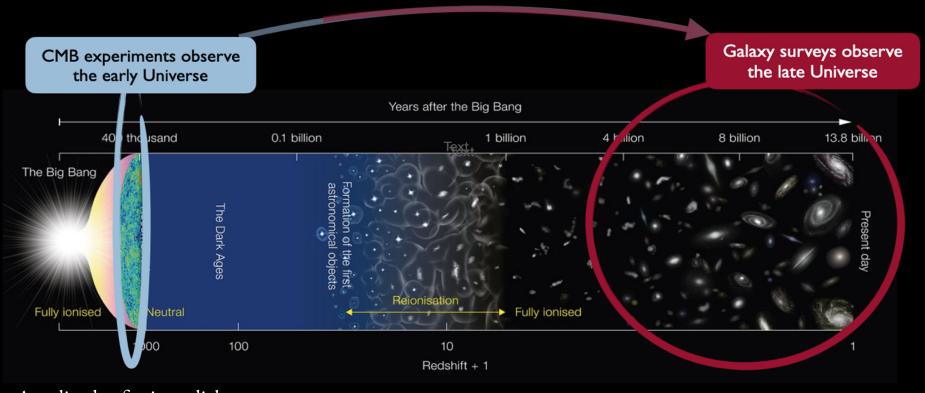


Image credit: Andrey Kravtsov and Anatoly Klypin

- What about the perturbations?
- The statistics of the density field can tell us about the growth of structure complementary to geometrical information.



Testing  $\Lambda$ CDM: Is the late time clustering compatible with the  $\Lambda$ CDM prediction assuming initial conditions from the CMB?

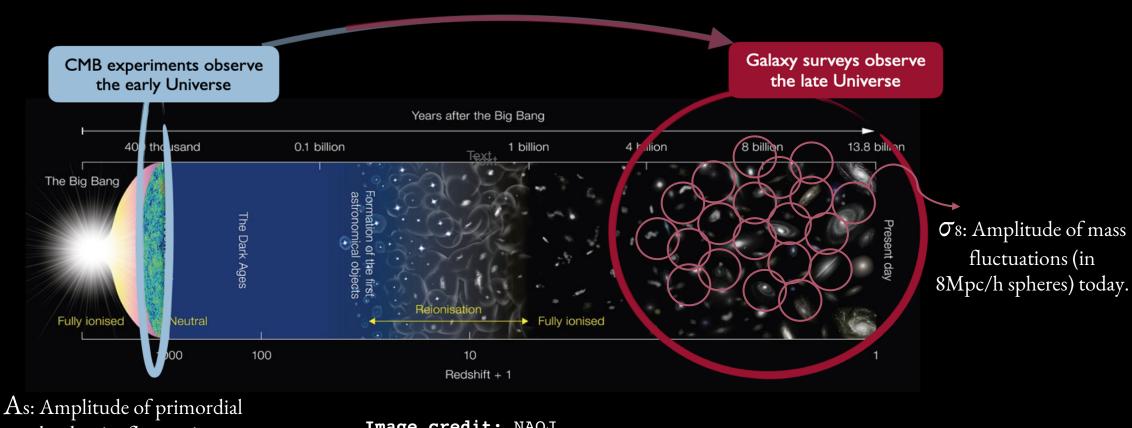


As: Amplitude of primordial scalar density fluctuations.

Image credit: NAOJ



# Testing $\Lambda$ CDM: Is the late time clustering compatible with the ΛCDM prediction assuming initial conditions from the CMB?



scalar density fluctuations.

Image credit: NAOJ

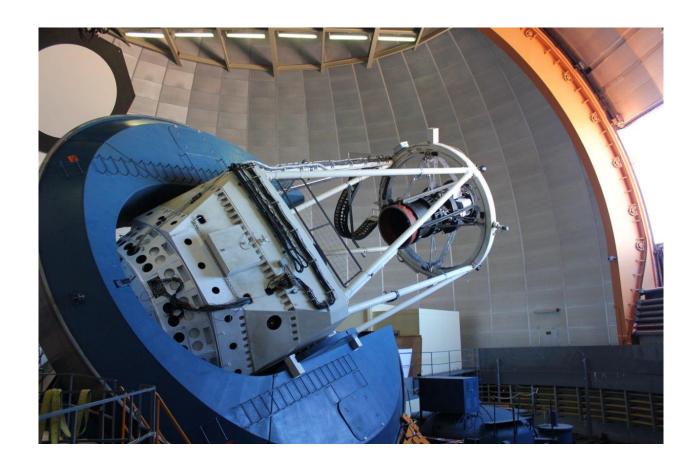


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# The Dark Energy Survey (DES)

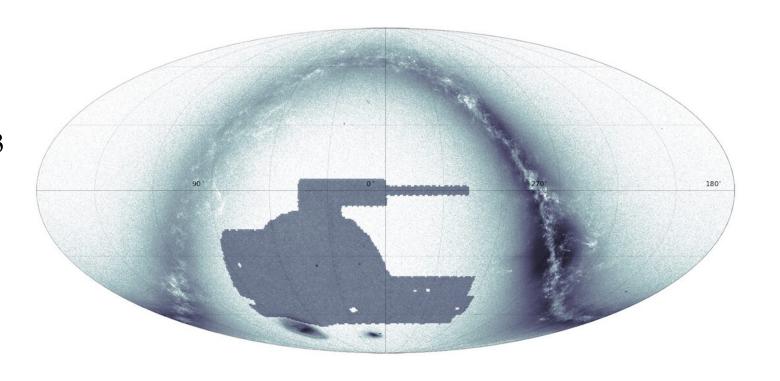






# The Dark Energy Survey (DES)

- 570 Megapixel camera for the Blanco 4m telescope in Chile.
- Full survey 2013-2019 (Year 3 2013-16).
- Wide field: 5000 sq. deg. in 5 bands. ~23 magnitude.
- DES Y3: Positions and shapes
   of > 100M galaxies.



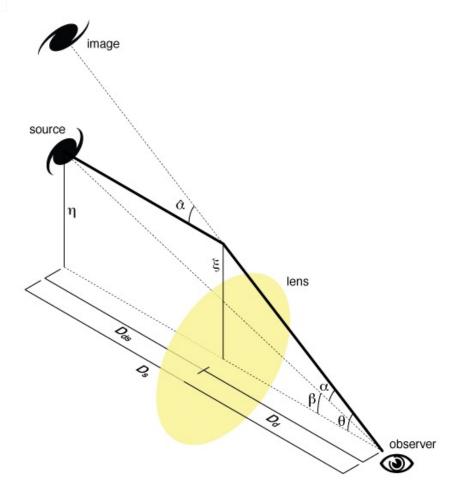


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## Weak Gravitational Lensing



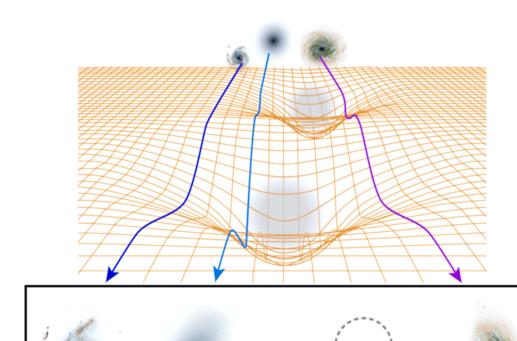
$$\hat{\alpha} = \frac{4GM}{c^2 \xi} \qquad {\mbox{\tiny <- For a point mass}}$$

$$ec{lpha}(ec{ heta}) = ec{
abla} \psi(ec{ heta})$$
 <- In general

$$\psi(ec{ heta}) = rac{2D_{ds}}{D_d D_s c^2} \int \Phi(D_d ec{ heta},z) dz$$



# Weak Gravitational Lensing



To first order, unlensed coordinates are transformed to the lensed coordinates according to the lensing Jacobian

$$A_{ij} = egin{array}{ccc} \delta_{ij} - rac{\partial \psi}{\partial heta_i \partial heta_j} = egin{bmatrix} 1 - \kappa - \gamma_1 & \gamma_2 \ \gamma_2 & 1 - \kappa + \gamma_1 \end{bmatrix}$$

Galaxy ellipticities transform as

$$\epsilon \, pprox \epsilon_s + \gamma$$

Galaxies are randomly oriented (before lensing) so:

$$\langle \epsilon \rangle = \langle \epsilon_s \rangle + \langle \gamma \rangle = \langle \gamma \rangle$$

APS/<u>Alan Stonebraker</u>; galaxy images from STScI/AURA, NASA, ESA, and the Hubble Heritage Team



# Weak Gravitational Lensing

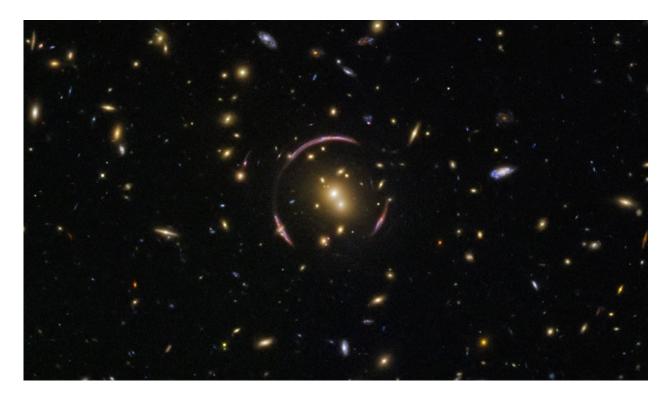


Image credit: ESA/Hubble

& NASA

#### Strong gravitational lensing:

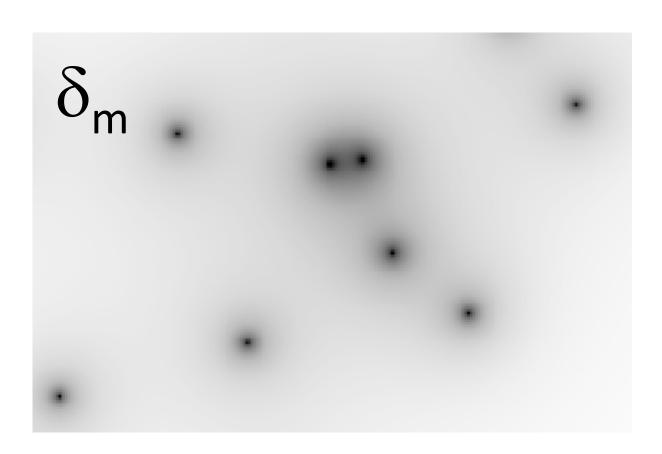
- Prettier
- Much rarer!



#### What I'll talk about

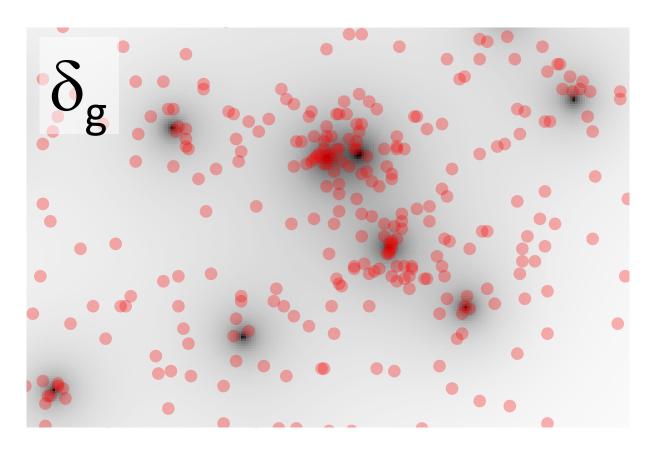
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We want to access the matter perturbations  $\delta_{\rm m}$  (because their e.g. 2-point statistics are sensitive to cosmology)





We use two observables to do this:

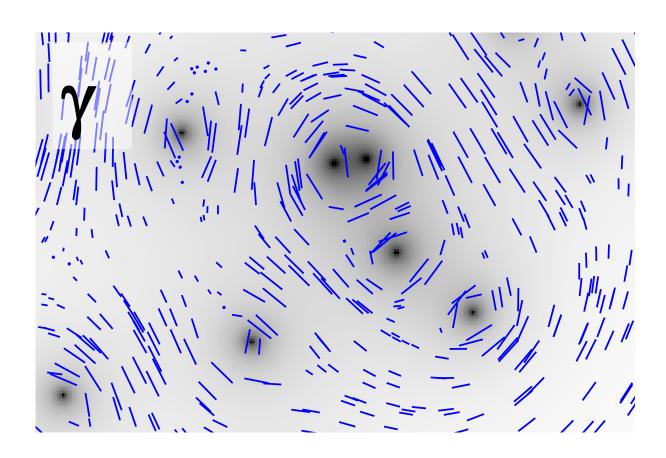
1.  $\delta_g$ : Counts of galaxies:

$$<\delta_g\delta_g> = b^2<\delta_m\delta_m>$$

b is the galaxy bias and is unknown...

"galaxy clustering"





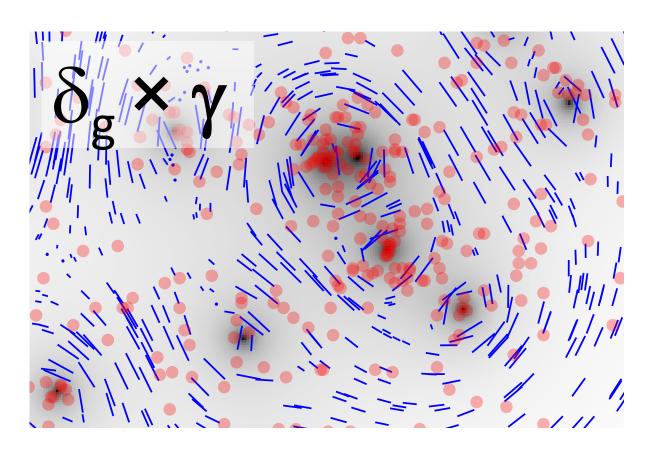
We use two observables to do this:

- 2. Weak lensing shear,  $\gamma$ :
  - Produces coherent galaxy ellipticities.
  - Depends directly on projected  $\delta_{\rm m}$ :

$$<\gamma\gamma>\sim<\delta_m\delta_m>$$

"cosmic shear"





We can also use the cross-correlation:

$$<\delta_g \gamma> \sim b < \delta_m \delta_m >$$

Also sensitive to galaxy bias

"galaxy-galaxy lensing"

"Lens galaxies"

"Source galaxies"



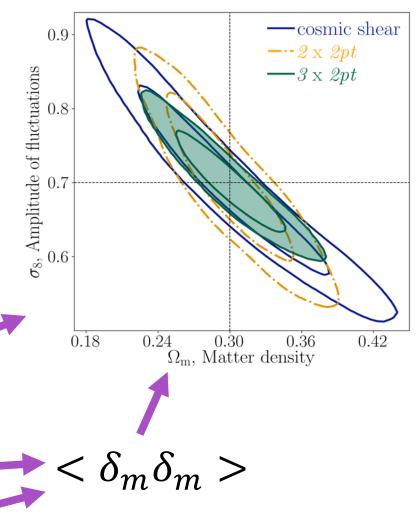
#### Summarizing, we use...

- 1. Galaxy number density field  $\delta_{
  m g}$
- 2. The weak lensing shear field  $\gamma$

i) 
$$<\gamma\gamma>\sim<\delta_m\delta_m>$$

ii) 
$$<\delta_g\delta_g>=b^2<\delta_m\delta_m>$$

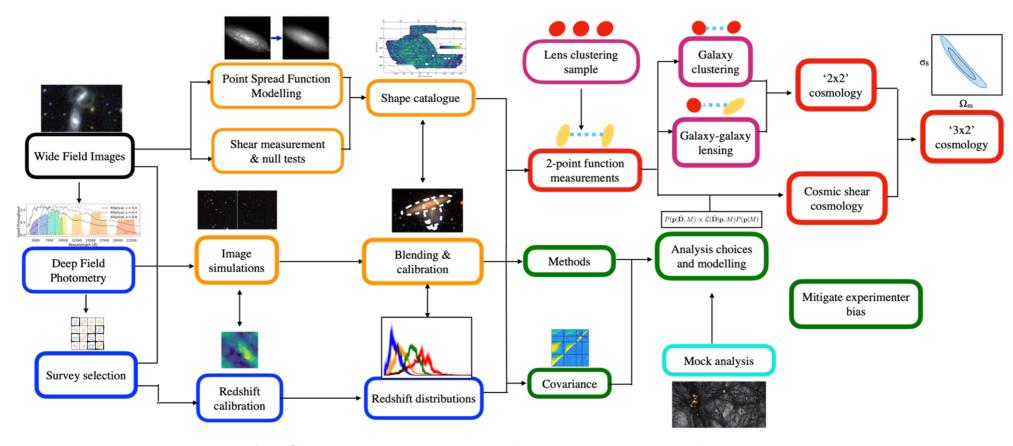
iii) 
$$<\delta_g\gamma> \sim b<\delta_m\delta_m>$$



(where <> means 2 point correlation function or power spectrum)



# The DES Year 3 analysis

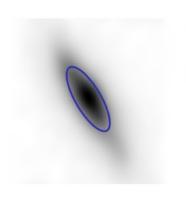


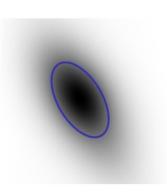
LCDM — WL+LSS — Redshifts — Shapes — Clustering — Simulations — Theory — Results

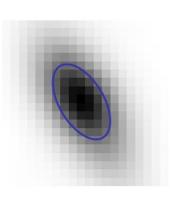
22/07/2021 Niall MacCrann 20

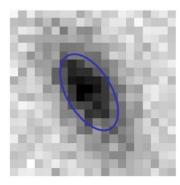


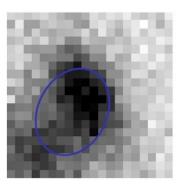
#### The Challenges: Shear estimation











#### Galaxy images have:

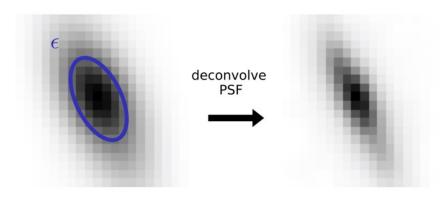
- Complex morphologies (ellipticity not uniquely defined)
- Blurring due to the atmosphere / telescope optics
- Noise
- Blending

Shear estimation biases parameterized as

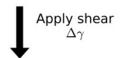
$$\left\langle \epsilon^{\mathsf{obs}} \right
angle = \left( 1 + \mathit{m} \right) \left\langle \gamma \right\rangle + \mathit{c}$$

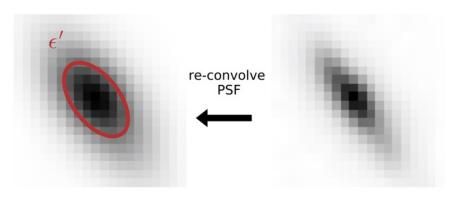


#### The Challenges: Shear estimation



$$R \equiv (1+m) \equiv \frac{\partial \epsilon}{\partial \gamma} \approx \frac{\epsilon' - \epsilon}{\Delta \gamma}$$





#### Metacalibration

- A method for calibrating the shear estimate without requiring complex calibration simulations (Huff & Mandelbaum 2017, Sheldon & Huff 2017).
- Generalized to full scenes in Sheldon, Becker, NM et al. 2020.
- But for blends between galaxies at different redshifts, calibration simulations still required.

# Which is real vs simulated?

Simulate galaxy images in multiple photometric bands and apply the same measurement pipeline



# simulated

real

Simulate galaxy images in multiple photometric bands and apply the same measurement pipeline MacCrann+2021

#### Calibrate shear biases with image simulations

$$ar{\epsilon}^{\mathsf{obs}} = (1+m)^{\gamma} + c$$
observed ellipticity multiplicative error additive error

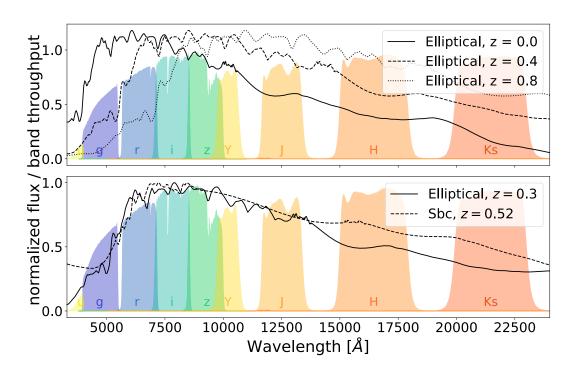
- Few percent multiplicative biases **due to blending** (-1.5 to -4% depending on redshift bin)
- Joint impact of blending on shear and photo-z characterized by effective redshift distribution

$$\bar{\epsilon}^{\text{obs}} = \int dz \, n_{\gamma}(z) \gamma^{\text{true}}(z) + c + \text{noise}$$

MacCrann+2021



#### The Challenges: Redshift estimation



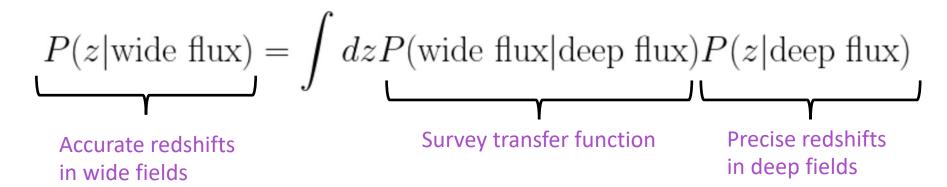
Buchs et al. 2019

- Accurate redshift distributions n(z)
   required for theoretical predictions.
- Imaging surveys have a limited number of bands.
- Redshifts estimated from this very crude spectrum.
- Degeneracy between galaxy type and redshift



# The Challenges: Redshift estimation

- In Year 3 we used a novel "SOMPZ" method (see Buchs et al. 2019, Alarcon et al. 2019, Myles et al. 2021).
- DES also has a smaller (~30 deg²) deep survey which has overlap with near infrared data (J, H, Ks bands see Hartley, Choi et al. 2021). In this area, highly accurate and precise redshift estimation is possible. One can leverage this information via

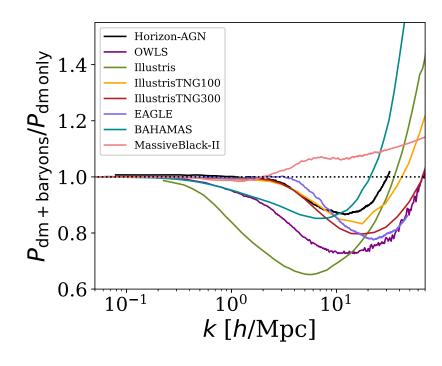




#### The Challenges: Theoretical Predictions

- Weak lensing observables are sensitive to the small-scale matter power spectrum (k>1 h/Mpc). Galactic astrophysics ("Baryonic effects"), affects the matter distribution here, much harder to simulate than gravity-only sims.
- Nonlinear galaxy bias and intrinsic alignments becoming important:

$$\delta_g = b_1 \delta_m + b_2^2 \delta_m^2 + \text{other } O(\delta_m^2) + O(\delta_m^3) + \dots$$

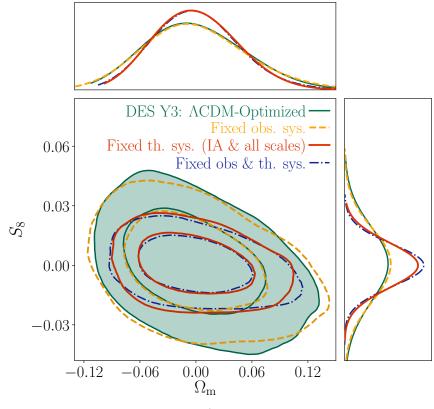


Chisari et al. 2019



# The Challenges: Theory Predictions

- We largely address these issues by throwing away information!
  - Conservative scale cuts (see Krause et al. 2021 and Secco & Samuroff 2021)
  - Extra nuisance parameters (see Pandey et al. 2019 for nonlinear bias model)
  - Analytic marginalization schemes (see NM et al.
     2019 for "point-mass" marginalization)
- Theoretical uncertainties were our limiting systematics for DES Y3 cosmic shear



Amon et al. 2021



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(https://arxiv.org/abs/2105.13549)

Drumroll....

#### The Results: Internal consistency

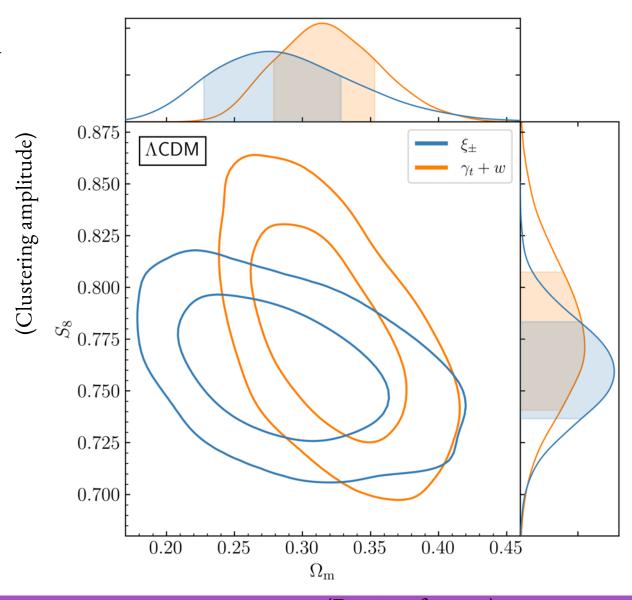
Two correlated cosmological probes:

- 1. **Cosmic shear** (blue)
- Galaxy clustering and tangential shear (orange)

We find consistency between them.

Cosmic shear most sensitive to clustering amplitude.

Galaxy clustering and tangential shear more sensitive to total matter density.



#### The Results: 3x2pt

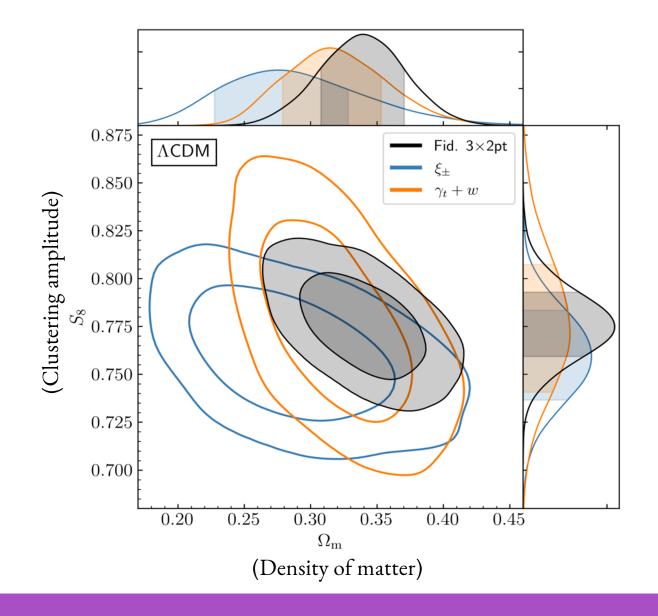
- Combine these into the **3x2pt** probe of large-scale structure.
- Factor of 2 improvement in constraining power w.r.t. DES Year 1.

In 
$$\Lambda$$
CDM: 
$$S_8 = 0.776^{+0.017}_{-0.017} \quad (0.776)$$

$$\Omega_{\rm m} = 0.339^{+0.032}_{-0.031} \quad (0.372)$$

$$\sigma_8 = 0.733^{+0.039}_{-0.049} \quad (0.696)$$
In  $w$ CDM: 
$$\Omega_{\rm m} = 0.352^{+0.035}_{-0.041} \quad (0.339)$$

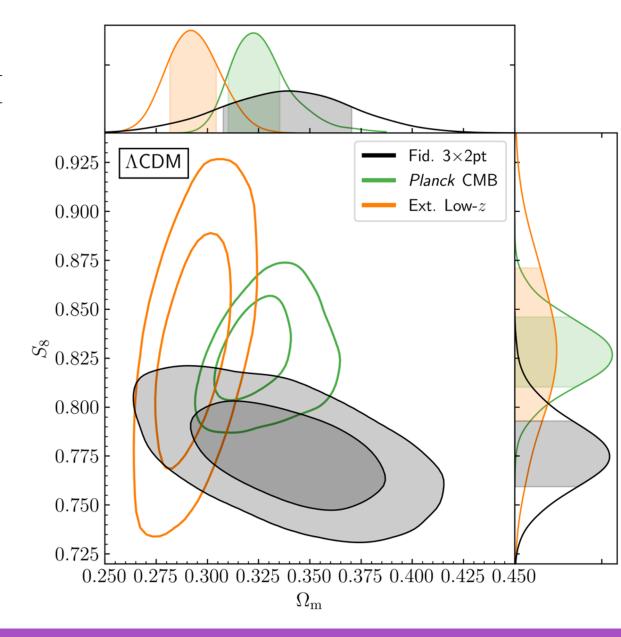
$$w = -0.98^{+0.32}_{-0.20} \quad (-1.03)$$



#### The Results: Consistency in ΛCDM

We construct three independent data sets:

- Weak lensing and clustering from DES (3x2pt)
- 2. The combination of other low-redshift **non-lensing** data (Ext. Low-z): SNe Ia, BAO, RSD.
- 3. Planck CMB
- No significant evidence of inconsistency between **DES Y3**3x2pt and *Planck* CMB (0.71.5 $\sigma$  or p=0.13-0.48)



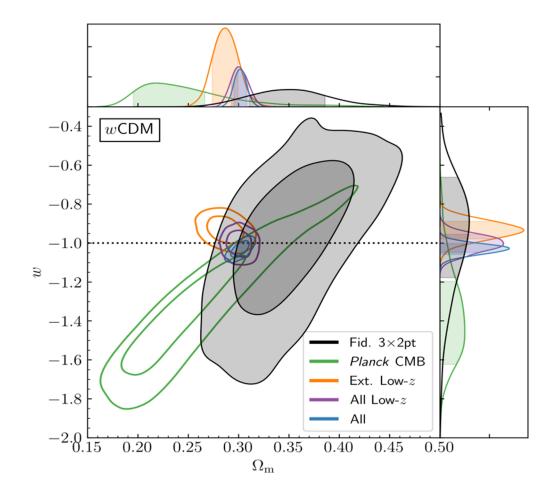
# The Results: Dark Energy

- 3% constraint on w when combined with external datasets
- No evidence for w!=-1 (i.e. consistent with cosmological constant)

$$\sigma_8 = 0.810^{+0.010}_{-0.009} (0.804),$$

$$\Omega_{\rm m} = 0.302^{+0.006}_{-0.006} (0.298),$$

$$w = -1.03^{+0.03}_{-0.03} (-1.00)$$



# Open Questions....

- We found indications of systematic effects in some of the lens redshift bins. More work required on sample selection and characterization for **angular** clustering analyses
- Meanwhile the weak lensing constraints are significantly degraded by our conservative intrinsic alignment modeling choice can we use priors from simulations or external data to improve on this for Y6 / LSST?
- How much can going beyond 2-point statistics improve constraining power to further test ΛCDM? Some papers exploring this are in prep.

Papers available at: <a href="https://www.darkenergysurvey.org/des-year-3-cosmology-results-papers/">https://www.darkenergysurvey.org/des-year-3-cosmology-results-papers/</a>

#### Dark Energy Survey Year 3 results. List of key and supporting papers

- 1. "Blinding Multi-probe Cosmological Experiments" J. Muir, G. M. Bernstein, D. Huterer et al., arXiv: 1911.05929, MNRAS 494 (2020) 4454
- 2. "Photometric Data Set for Cosmology", I. Sevilla-Noarbe, K. Bechtol, M. Carrasco Kind et al., arXiv:2011.03407, ApJS 254 (2021) 24
- 3. "Weak Lensing Shape Catalogue", M. Gatti, E. Sheldon, A. Amon et al., arXiv:2011.03408, MNRAS 504 (2021) 4312
- 4. "Point Spread Function Modelling", M. Jarvis, G. M. Bernstein, A. Amon et al., arXiv:2011.03409, MNRAS 501 (2021) 1282
- 5. "Measuring the Survey Transfer Function with Balrog", S. Everett, B. Yanny, N. Kuropatkin et al., arXiv:2012.12825
- 6. "Deep Field Optical + Near-Infrared Images and Catalogue", W. Hartley, A. Choi, A. Amon et al., arXiv:2012.12824
- 7. "Blending Shear and Redshift Biases in Image Simulations", N. MacCrann, M. R. Becker, J. McCullough et al., arXiv:2012.08567
- 8. "Redshift Calibration of the Weak Lensing Source Galaxies", J. Myles, A. Alarcon, A. Amon et al., arXiv:2012.08566
- 9. "Redshift Calibration of the MagLim Lens Sample using Self-Organizing Maps and Clustering Redshifts", G. Giannini et al., in prep.
- 10. "Clustering Redshifts Calibration of the Weak Lensing Source Redshift Distributions with redMaGiC and BOSS/eBOSS", M. Gatti, G. Giannini, et al., arXiv:2012.08569
- 11. "Calibration of Lens Sample Redshift Distributions using Clustering Redshifts with BOSS/eBOSS", R. Cawthon et al. arXiv:2012.12826
- 12. "Phenotypic Redshifts with SOMs: a Novel Method to Characterize Redshift Distributions of Source Galaxies for Weak Lensing Analysis" R. Buchs, C.Davis, D. Gruen et al. arXiv:1901.05005, MNRAS 489 (2019) 820
- 13. "Marginalising over Redshift Distribution Uncertainty in Weak Lensing Experiments", J. Cordero, I. Harrison et al., in prep.
- 14. "Exploiting Small-Scale Information using Lensing Ratios", C. Sánchez, J. Prat et al., in prep.
- 15. "Cosmology from Combined Galaxy Clustering and Lensing Validation on Cosmological Simulations", J. de Rose et al., in prep.
- 16. "Unbiased fast sampling of cosmological posterior distributions", P. Lemos, R. Rollins, N. Weaverdyck, A. Ferte, A. Liddle et al., in prep.
- 17. "Assessing Tension Metrics with DES and Planck Data", P. Lemos, M. Raveri, A. Campos et al., arXiv:2012.09554
- 18. "Dark Energy Survey Internal Consistency Tests of the Joint Cosmological Probe Analysis with Posterior Predictive Distributions", C. Doux, E. Baxter, P. Lemos et al. arXiv:2011.03410, MNRAS **503** (2021) 2688
- 19. "Covariance Modelling and its Impact on Parameter Estimation and Quality of Fit", O. Friedrich, F. Andrade-Oliveira, H. Camacho et al., arXiv:2012.08568
- 20. "Multi-Probe Modeling Strategy and Validation", E. Krause et al., in prep.
- 21. "Curved-Sky Weak Lensing Map Reconstruction", N. Jeffrey, M. Gatti, C. Chang et al., in prep.
- 22. "Galaxy Clustering and Systematics Treatment for Lens Galaxy Samples", M.Rodríguez-Monroy, N. Weaverdyck, J. Elvin-Poole, M. Crocce et al., in prep.
- 23. "Optimizing the Lens Sample in Combined Galaxy Clustering and Galaxy-Galaxy Lensing Analysis", A. Porredon, M. Crocce et al., arXiv:2011.03411 PhRvD 103 (2021) 043503
- 24. "High-Precision Measurement and Modeling of Galaxy-Galaxy Lensing", J. Prat, J. Blazek, C. Sánchez et al., in prep.
- 25. "Constraints on Cosmological Parameters and Galaxy Bias Models from Galaxy Clustering and Galaxy-Galaxy Lensing using the redMaGiC Sample", S. Pandey et al., in prep.
- 26. "Cosmological Constraints from Galaxy Clustering and Galaxy-Galaxy Lensing using the Maglim Lens Sample" A. Porredon, M. Crocce et al., in prep.
- 27. "Cosmology from Cosmic Shear and Robustness to Data Calibration", A. Amon, D. Gruen, M. A. Troxel et al., in prep.
- 28. "Cosmology from Cosmic Shear and Robustness to Modeling Assumptions", L. Secco, S. Samuroff et al., in prep.
- 29. "Magnification modeling and impact on cosmological constraints from galaxy clustering and galaxy-galaxy lensing", J. Elvin-Poole, N. MacCrann et al., in prep.
- 30. "Cosmological Constraints from Galaxy Clustering and Weak Lensing" The DES Collaboration in prep.

# List of participants

(Early Career Scientists in bold)

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